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# Chapter



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## Decomposition of Heterogeneous Classification Problems

12800017 <sup>A1</sup>, 12800017 <sup>A1</sup>, Se June Hong <sup>A1</sup>, Jonathan R. M. Hosking <sup>A1</sup>, Jorge Lepre <sup>A1</sup>, Edwin P. D. Pednault <sup>A1</sup>, Barry K. Rosen <sup>A1</sup>

<sup>A1</sup> IBM Research Division, T. J. Watson Research Center, P.O. Box 218, Yorktown Heights, NY 10598, U.S.A.

#### Abstract:

In some classification problems the feature space is heterogeneousin that the best features on which to base the classificationare different in different parts of the feature space. In some other problems the classes can be divided into subsetssuch that distinguishing one subset of classes from anotherand classifying examples within such subsetsrequire very different decision rules, involving different sets of features. In such heterogeneous problems, many modeling techniques (including decision trees, rules, and neural networks) evaluate the performance of alternative decision rules by averaging over the entire problem space, and are prone to generating amodel that is suboptimal in any of the regions or subproblems. Better overall models can be obtained by splitting the problemappropriately and modeling each subproblem separately.

This paper presents a new measure to determine the degree of dissimilaritybetween the decision surfaces of two given problems, and suggests a way tosearch for a strategic splitting of the feature space that identifies regions with different characteristics. We illustrate the concept using a multiplexor problem.

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**Abstract:** This paper re-examines the problem of parameter estimation in Bayesian networks with missing values and hidden variables from the perspective of recent work in on-line learning [12]. We provide a unified framework for parameter estimation that encompasses both on-line learning. where the model is continuously adapted to new data cases as they arrive, and the more traditional batch learning, where a pre-accumulated set of samples is used in a one-time model selection process. In the batch case,... (Update)

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.... execute only a partial maximization step of the EM algorithm based on gradient techniques leading to generalized EM algorithms [8, 10, 11, 9]. In this paper, we report on an experimental comparison between EM and (accelerated) conjugate gradients to maximum likelihood...

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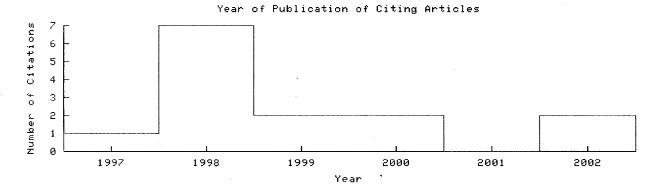
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- 1735 Maximumlikelihood from incomplete data via the EM algorithm (context) Dempster, Laird et al. 1977
- 1612 Elements of Information Theory (context) Cover, Thomas 1991
- 511 Cambridge University Press (context) Horn, Johnson 1985
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- 118 How to use expert advice (context) Cesa-Bianchi, Freund et al. 1993
- 103. Operations for learning with graphical models Buntine 1994
- 85 The EM algorithm for graphical association models with missi.. (context) Lauritzen 1995
- 78 The ALARM monitoring system: A case study with two probabili.. (context) Beinlich, Suermondt et al. 1989
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- 56 Local learning in probabilistic networks with hidden variabl.. Russell, Binder et al. 1995
- 40 Inference and missing data (context) Rubin 1976
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...rules, Missing Values, Preprocessing, Decision Trees. 1 Introduction The missing values problem is an old one for analysis tasks[9] [12]. The waste of data which can result from casewise deletion of missing values, obliges to propose alternatives approaches. A current one is to...

...as that of the defining boolean function. **There has been some empirical work studying the task of learning from incomplete data [8, 35, 15].** With the goal of giving a theoretical explanation for the observed empirical phenomena, Schuurmans and Greiner [38, 39] studied the...

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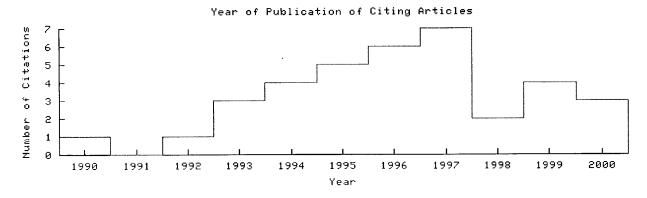
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```

## Citations (may not include all citations):

- 1188 Induction of decision trees (context) Quinlan 1986
- 1075 Classification and regression trees (context) Breiman, Friedman et al. 1984
- 164 The CN2 induction algorithm (context) Niblett 1989
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